- 1 Adverse childhood experiences during childhood and academic attainment at age 7 and 11
- 2 years: an electronic birth cohort study

- 4 Abstract
- 5 Objectives
- 6 Adverse childhood experiences (ACEs) have a negative impact on childhood health, but their impact
- 7 on education outcomes is less well-known. We investigated whether or not ACEs were associated
- 8 with reduced educational attainment at age 7 and 11 years.
- 9 Study design
- 10 Population based electronic cohort study
- 11 Methods
- We analysed data from a total population electronic child cohort in Wales, UK. ACEs (exposures)
- were living with an adult household member with any of (i) serious mental illness (SMI), (ii) common
- mental disorder (CMD), (iii) an alcohol problem; (iv) child victimisation, (v) death of a household
- member and (vi) low family income. We used multilevel logistic regression to model exposure to
- these ACEs and not attaining the expected level at statutory education assessments, Key Stage (KS) 1
- and KS2 separately, adjusted for known confounders including perinatal, socio-economic and school
- 18 factors.
- 19 Results
- There were 107,479 and 43,648 children included in the analysis, with follow-up to 6-7 years (KS1)
- 21 and 10-11 years (KS2) respectively. An increased risk of not attaining the expected level at KS1 was
- associated with living with adult household members with CMD (aOR 1.13 (95% CI 1.09-1.17) or an
- 23 alcohol problem (aOR 1.16 (95% CI 1.10-1.22), childhood victimisation (aOR 1.58 (95% CI 1.37-
- 24 1.82), death of a household member (aOR 1.14 95% CI 1.04-1.25) and low family income (aOR 1.92
- 25 95% CI 1.84-2.01). Similar results were observed for KS2. Children with multiple adversities had
- substantially increased odds of not attaining the expected level at each educational assessment.
- 27 Conclusion
- 28 The educational potential of many children may not be achieved due to exposure to adversity in
- 29 childhood. Affected children who come in to contact with services should have relevant information
- 30 shared between health and care services, and schools to initiate and facilitate a coordinated approach
- 31 towards providing additional support and help for them to fulfil their educational potential, and
- 32 subsequent economic and social participation.

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Introduction

Academic achievement during childhood is influenced by complex interactions between a range of biological, social and environmental factors including the home environment. Mental disorders and alcohol misuse are common in families. Although severe mental illnesses such as schizophrenia and bipolar disorder affect 1–2% of adults in the U.K., 1,2 common mental disorders (CMD), including depression, anxiety, panic, and somatisation, can affect 16% of adults. Alcohol misuse is also prevalent, affecting 8% - 10% of adults and a significant proportion also have co-occuring mental disorders. We previously estimated that 30% of infants lived with an adult who had a mental disorder⁵ and up to 30% of children have been reported to live with an adult binge drinker. 6

 Experience during childhood of long-term or acute stress for example due to mental disorders, alcohol related problems or a death in the household have been shown to increase the risk of unplanned hospital admissions during childhood, poorer mental and physical health (increased risk of cancer and cardiovascular disease), as well as negative social outcomes during adulthood (e.g. leaving school without qualifications, unemployment and incarceration). The impact of these adverse experiences on education outcomes in school age children is less well-known.

Adverse childhood experiences are thought to elevate glucocorticoid hormones (cortisol), with chronic stress impeding the regulation of stress physiology. For example, children exposed to maternal depression have been shown to have higher levels of salivary cortisol, which could be a mediator in the pathway between chronic stress and lower executive functioning (e.g. working memory). Differences in brain activity and hippocampal volume have also been observed according to whether or not children have experienced maltreatment or neglect, but the reasons for this are unclear. The pre-frontal cortex and executive functions of the brain are known to be sensitive to stress, therefore we hypothesised that exposure to adverse childhood experinces impacts negatively on educational attainment during childhood, and contributes to the observed inequalities in education outcomes in children. Understanding the contribution of childhood adversity that may be preventable to the observed social inequalities in education outcomes is important to help us undertand the potential impact that interventions that build resilience and mitigate the effects of early adversity can have on on later health, wellbeing, economic activity and social participation.

In this study we investigated whether or not adverse childhood experiences were associated with reduced educational attainment at age 7 and 11 years, and the magnitude of these effects, whilst taking in to account the effects of area level social deprivation, school factors, household composition, socio-demographic and perinatal health indicators using linked administrative datasets. We also

explored whether or not children who experienced adversity were more likely to have special education needs requiring learning support.

Methods

Data sources and study design

 The Wales Electronic Cohort for Children (WECC), has records for 981 404 children born between 1990 and 2012, for a child or mother resident in Wales¹² with information held in the Wales Demographic Service Dataset (a Wales-wide administrative register for all individuals with a general practitioner (GP)). WECC is derived by record-linking de-identified routinely collected health and social datasets described in Table 1, using a unique Anonymised Linking Field (ALF) for each individual. It is accessed through the Secure Anonymised Information Linkage (SAIL) databank at Swansea University, UK.^{13,14} To enable individuals living in the same household to be anonymously linked, residential anonymised linking fields (RALFs) were created by encrypting individual's addresses for the study period.^{15,16}

Table 1: Data sources

Datasets*	Data source**
Wales Electronic Cohort for	Wales Demographic Service
Children	Office of National Statistics birth records
	Office of National Statistics death records
	National Community and Child Health database
	Congenital Anomaly Register and Information
	Service
Hospital inpatient admission data	Patient Episode Dataset for Wales
General Practice data	General Practice Database
Education data	Pupil Annual School Census
	National Pupil Database

^{*}Datasets were linked for each child's record using an anonymised linking field based on their NHS number produced by the NHS Wales Informatics Service (NWIS), a NHS trusted third party, with more than 99.85% accuracy.¹⁴
** data sources are described in supplementary Table 1.

 We included children who had data available for statutory educational assessments in the UK at age 6-7 years and 10-11 years, and for whom adult household members had sufficient GP data to ascertain exposure measures. Exclusions are described in figure 1. To preserve the temporal order of exposure and outcomes in the analyses, only those children who took the statutory assessment at the expected age (using proxy start date of 1st May for each year) were included in the analyses.

The Wales Electronic Cohort for Children was approved by an independent Information Governance Review Panel. The Wales Electronic Cohort for Children was judged by the Research Ethics Committee for Wales to be an anonymised research database that does not require ethical review, in line with National Ethics Committee guidance.

104 **Outcomes** 105 Children in Wales have two statutory assessments during compulsory education that is normally taught between ages 5-7 years and 8-11 years 17 (two further assessments are taken at age 13-14 and 106 107 age 15-16 years). In this analysis, the education outcomes were attaining the expected level in 108 statutory assessment at (i) age 6-7 years, Key Stage 1 (KS1) and (ii) age 10-11 years, Key Stage 2 109 (KS2). KS1 and KS2 are teacher assessments (rather than formal tests) in three core subjects (a 110 language, mathematics and science) where an overall binary measure is derived to indicate whether the expected standard is met or not. 111 112 A third outcome about provision of extra learning support for a child at school (Special Educational 113 Need (SEN) provision) was also investigated as an indicator of impaired academic performance. This 114 115 was coded as a yes/no binary variable, indicating any help received by a child, which may include one to one help or support through external provision to the school (described in UK local educational 116 authority schools as School action, School action plus and Statemented). 117 118 119 **Exposures** Exposure was measured (i) between birth to age 6-7 years (KS1) and (ii) between birth to age 10-11 120 121 years (KS2). Household members were defined as those living in the same household as the child on 122 their 1st, 5th and 8th birthday. 123 124 We defined six measures of childhood adversity. Three of these related to living with an adult 125 household member with any of: (i) serious mental illness diagnosis (e.g. bipolar disorder, schizophrenia); 18 (ii) CMD (e.g. depression, anxiety) 19 and (iii) an alcohol problem defined by a 126 record of heavy drinking in primary care records²⁰ or an alcohol-related hospital admission²¹, dating 127 128 back to 1998. The fourth measure was childhood victimisation defined as an inpatient hospital admission of the child where victimisation was a contributing reason for admission²². The fifth 129 130 measure was death of a household member and the sixth measure was low family income, defined as 131 eligibility for free school meals in the year the Key Stage assessment was taken. 132 We used validated algorithms for ascertaining cases of CMD using diagnosis, symptoms and 133 treatments¹⁹ and lifetime diagnosis of psychotic disorders¹⁸ recorded in GP datasets. Problematic 134 alcohol use among household members was ascertained using a set of General Practice symptoms, 135 136 diagnosis and procedures (Read Version 2) codes that we had previously defined²⁰ for current or past 137 heavy alcohol drinking (anything above the recommended limit), alcoholic disease (liver or other), 138 poisoning or treatment evidence and/or any alcohol-related emergency hospital admission during the 139 exposure period. Childhood victimisation was ascertained using a defined set of ICD-10 codes in any 140 position of the first consultant episode of an inpatient hospital admission²². For adult household

members living with the child at age 1 year, we separated out the presence of alcohol-related problems, CMD or serious mental illness according to whether they were recorded before the birth of the child (pre-birth) or during the first year of life.

Statistical analysis

We used multilevel logistic regression to model exposure to adverse childhood experiences and (i) not attaining the expected level at KS1 and KS2 separately and (ii) receipt of special educational need provision. Multilevel modelling was used to include the hierarchical structure of children within schools, so that correlation attributable to schools could be included in the modelling. For each exposure, we estimated odds ratios (ORs) with 95% confidence intervals (CI), adjusting for confounding variables. We used likelihood ratios to test two-way interaction terms between exposures, and between each exposure and each of maternal age, single adult household, and small-area deprivation. We repeated the analyses to estimate ORs for any SEN provision allocated in the year the Key Stage assessment was taken, adjusted for maternal and perinatal characteristics.

A Direct Acyclic Graph (DAG)²³ was drawn to visualise confounding relationships and obtain a minimal sufficient adjustment set of potential confounders for analyses (figure 2 & 3). We adjusted for household composition (living in a single adult household) and measures of social disadvantage including young maternal age (<18 years) and small-area deprivation (based on Townsend score,²⁴ using the 2001 census for income and address). Perinatal factors (such as gestational age, academic season of birth, and breastfeeding at birth or 6–8 weeks [when the NHS collects such data]) were adjusted for as the DAG confirmed these factors were on the causal pathway but were not mediators between adverse childhood experiences and educational attainment. We also adjusted for school factors (number of school moves, average size of school and percentage of children eligible for free school meals) at each Key Stage assessment.

Data were missing for breastfeeding (22% and 42%) and maternal smoking (70% and 80%) in the KS1 and KS2 cohorts respectively. The slightly higher proportions in the KS2 cohort were due to lower data completeness in the earlier years of the cohort. Tabulations by year and unitary authority showed that these could be reasonably assumed to be missing at random, due to organisational and administrative differences in data collection between hospitals. There was little difference between statistical model imputations for these variables so we concluded that the cohorts were large enough to give sufficient precision. All other variables had less than 5% missing data. Multiple imputation with chained equations²⁵ was used to account for missing data with all covariates and the outcome variable included in the imputation model as described by White and Royston.²⁶ The results of the

177 multilevel modelling were consistent for complete case and the imputed dataset, so we present results 178 from the multiply imputed datasets. We used Stata IC (version 13) for statistical analyses. 179 Role of the funding source 180 181 182 The funders had no role in designing the study, data collection, analysis, or interpretation, or in writing the report. MAB's role in the design, analysis, and writing was independent of the funding 183 from Public Health Wales. The corresponding author had full access to all the data in the study and 184 185 final responsibility for the decision to submit for publication. 186 **Results** 187 There were 107,479 and 43,648 children in the cohort between 1998 and 2012 who were included in 188 189 this analysis, with follow-up to 6-7 years (KS1) and 10-11 years (KS2) respectively (figure 1). 190 Sociodemographic characteristics of the children were representative of national population statistics 191 in both cohorts (Supplementary table 2). About 3% of children (n=3,313) were born to a mother who was under 18 years of age at childbirth, and 35,651 (33.2%) had lived in a single adult household (16+ 192 193 years of age) between birth and age 6-7 years. 194 195 Overall 19,508 (18.2%) of children did not attain the expected levels at KS1, 8462 (19.4%) did not 196 attain the expected level at KS2, 27,393 (25.5%) and 11,910 (27.3%) had some SEN provision in the 197 year they took KS1 and 2 (Table 1). 198 199 15,553 (14.5%) children aged 1 year lived with an adult who had a history of CMD, and 41,257 200 (38.4%) children lived with an adult who had a CMD between birth and age 6-7 years (Table 1). Less 201 than 1% of children had lived with an adult who had a serious mental illness. Children who lived with 202 adult household members with common mental disorder had an increased odds of not attaining both 203 KS1 (aOR 1.13 (95% CI 1.09-1.17) and KS2 aOR 1.13 (95% CI 1.07-1.19). A record of serious 204 mental illness in a household adult between birth and KS1 was also associated with increased odds of not attaining KS1 (aOR 1.21 (95% CI 1.02-1.42) but not at KS2 (aOR 0.97 (95% CI 0.79-1.19)). The 205 magnitude of effect for these two exposures at KS1 are similar because the majority of children in this 206 207 cohort (67.6%) who lived with an adult who had a serious mental illness were also exposed to CMD 208 in the household (Table 2). 209 210 Eleven percent of children in the KS1 cohort (n=12,224) and 17.1% (n=7,480) in the KS2 cohort had 211 lived with an adult with an alcohol related problem; these children had an increased odds for not 212 attaining KS1 (aOR 1.16 (95% CI 1.10-1.22) and KS2 (aOR 1.16 (95% CI 1.09-1.24)), after adjusting 213 for perinatal, socio-demographic, other adverse experiences and school factors.

214 215 One percent of children were admitted to hospital during the study period with recorded victimisation, and this group were also less likely to attain KS1 (aOR 1.58 (95% CI 1.37-1.82) and KS2 (aOR 1.88 216 217 (95% CI 1.52-2.33)) and more likely to have received SEN provision at KS1 (aOR 1.90 (95% CI 1.66-2.17) and at KS2 (aOR 1.79 (95% CI 1.46-2.20). 218 219 220 About three percent of children in the cohort experienced the death of a household member and this 221 was associated with an increased odds of not attaining KS1 (aOR 1.14 95% CI 1.04-1.25) and KS2 (aOR 1.13 95% CI 1.03-1.25). Low family income (measured as eligibility for a free school meal in 222 223 the year of taking KS1 or KS2) was also associated with an increased odds of not attaining KS1 (aOR 224 1.92 95% CI 1.84-2.01) and KS2 (aOR 1.65 95% CI 1.53-1.78). 225 226 The effects of socio-economic deprivation were similar on attainment at KS1 and 2, with lower levels 227 of attainment associated with higher levels of social deprivation. Young maternal age and percentage 228 of free school meals in the school attended in the Key Stage year, were both associated with lower educational attainment, although the magnitude of these associations were slightly smaller at KS2 229 230 compared with KS1. Children born to older mothers 30+ years were more likely to receive SEN 231 provision at KS1, while children born to younger mothers (under 24 years) were more likely to 232 receive this at KS2. 233 234 The inclusion of the two-way interaction terms between exposures, and between exposures and each 235 of maternal age, single adult household, and small-area deprivation did not improve the fit of the 236 model to the data at the 5% level. Where present, interactions failed to show consistent, 237 monotonically increasing or decreasing patterns of adjustment to the main effects of interest. 238 Moreover, they did not alter any of our substantive findings, consisting of changes to the third or fourth decimal place. Consequently, interactions were excluded in subsequent modelling and 239 240 interpretation. 241 242 Children who had multiple adversities had substantially increased odds of not attaining the expected level at each educational assessment as shown in figure 4, signalling a clear need for early 243 244 intervention in this group intervention to mitigate. For example the odds of not attaining KS1 are 245 3.59 times higher (aOR 3.59 95%CI 3.25-3.96) for a child who lives in a household in an area with 246 the highest level of social deprivation, is eligible for free school meals, and lives with an adult who 247 has a common mental disorder and alcohol related problems, compared with a similar child who lives 248 in a household in an area with the lowest level of social deprivation (Table 4). These data signal a 249 clear need for early identification of this group and intervention to mitigate the impacts of multiple 250 childhood adversities on education and subsequent longer-term social and economic outcomes.

Discussion

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This study shows that children exposed to adverse experiences during childhood were less likely, compared to non-exposed peers, to attain the expected level of education at age 6-7 years (KS1) and age 10-11 years (KS2) after controlling for socio-demographic characteristics, perinatal health indicators, household composition and school factors. The magnitude of this association varied according to the type and timing of exposure. For example, exposure during the first year of life to adults who had a history of CMD had a lower magnitude of effect on KS attainment compared to exposure during the years leading up to taking the KS assessments. The observed effect sizes for exposure to mental disorder or alcohol problems in the household were in addition to those observed for living in areas with high levels of social deprivation, suggesting that reducing the prevalence of these household exposures as well as ensuring children who are exposed are identified early and supported appropriately could make a difference to educational outcomes. The effects of these exposures were cumulative, such that children who had multiple exposures had an even higher likelihood of not attaining the expected level at KS assessments. Childhood victimisation and low family income had the biggest effect sizes for not attaining the Key Stages, possibly reflecting the severity of these exposures. Our measure of victimisation was based on hospital admissions only and is therefore likely to underestimate the true impact of victimisation on education outcomes. These findings highlight the importance trauma informed services for early detection of and intervention for affected children, including the need for additional support to mitigate the future impact on educational outcomes. Death of a household member was also associated with an increased risk of not attaining the expected level at KS assessments. We did not have sufficient data to explore this effect according to the relationship between the child and household member who had died or age at which this occurred. Further work is needed to fully understand how and in what circumstances death in a household impacts on a child's health and wellbeing.

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Only one previous study has investigated the impact of multiple adverse expeiences during childhood on educational outcome.²⁷ This Australian study reported that alcohol use, mental health issues and death of a parent increased the risk of poorer reading attainment at age 8 years but their analyses did not take account of differences in school factors, or examine the cumulative effects of child adversity on educational outcome. Other studies have included wider age ranges of children between 5 to 17 years, reported detrimental effects on educational attainment for household alcohol misuse,²⁷⁻³⁰ mental health³¹, or death in the household,³²⁻³⁴ and victimisation of the child.³⁵⁻³⁷ Most of these studies examined the impact of single adverse exposures and none adjusted for the multiple confounders of

286 deprivation, birth and socio-demographic characteristics, and school factors including school 287 concentration of poverty as we have done in our analysis. 288 We have previously shown that some adverse childhood experiences are socio-economically patterned 289 and that these rarely occur in isolation.^{5,7} Our study therefore adds to the current body of evidence by 290 considering the collective impact of a range of adverse exposures in the household, in addition to 291 socio-economic indicators on educational outcomes. 292 The key strength of this study is that it measures adverse exposures in the household using 293 administrative and healthcare data. This addresses the limitation of some previous studies which have 294 relied on self-reported data to ascertain exposure during childhood. It also uses data on a wide range 295 of perinatal, socio-demographic and school level data, to take account of the complex relationships 296 between these variables and the association between adverse childhood experiences and educational 297 outcomes. One limitation is the reliance on coding of administrative data and potential for 298 misspecification of coding, however any misclassification is unlikely to disproportionately affect one 299 group over another and so is unlikely to have created a bias in any particular direction. We did not 300 have data on parental education or IQ (as a proxy for variation in school engagement) nor on contact 301 with social care and therefore could not explore the role of these variables. Our data showed that 27% 302 of children had SEN provision however we were unable to explore any unmet need or the 303 appropriateness of this provision for individual children. 304 305 At a population level, our study demonstrates how the educational potential of many children may not be achieved due to exposure to adversity in childhood. Although the distribution of adverse childhood 306 307 experiences are socially patterned, our results suggest that the impacts of ACEs on educational 308 outcomes are in addition to those related to social deprivation. Thus, a combination of poverty and 309 childhood exposure to household mental disorders and alcohol related problems increases the 310 likelihood of failing the basic educational tests in language and maths by over 350% for children 311 living in the most compared to least deprived areas. 312 Critically, a poor start in education has been strongly linked with poorer educational outcomes across all schooling years, poorer employment prospects and consequently a poor economic outlook across 313 the life course. 7.38-40 Consequently, exposure to ACEs increases the chances that children develop into 314 adults with poor economic prospects; contributing to a cycle of hardship that fuels inequalities and 315 316 potentially locks families into deprivation and ill health across generations. There are already a range 317 of evidence-based interventions that provide parent and care-giver support, 41,42 pre-school enrichment^{43,44} and increasingly, trauma-informed educational services.^{45,46} It is no longer a lack of 318 effective interventions or sound economic arguments that is preventing safe and secure childhoods. It 319 320 is only a question of the political investment necessary to ensure subsequent generations achieve their

full potential for themselves and for the prosperity of communities in which they live.

In conclusion our study shows that children living with adults who have mental disorders or alcohol problems, who have experienced victimisation or experienced a death in the family are at increased risk of not achieving their educational potential. As these experiences are relatively common, it is important that appropriate conversations are initiated when affected children come in to contact with health and care services, and that relevant information is shared between health and care services and schools to facilitate a coordinated approach to tackle adverse household exposures such as alcohol misuse and family violence as early as possible, whilst supporting affected families and children. It is also important that schools are adequately resourced to provide the additional support needed for children from affected families to reduce their risk of lower educational outcomes and help them to fulfil their educational potential, and subsequent economic and social participation.

Author statement

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